

Name : Krish Singh

Roll: AID25072

Branch: B.Tech AI & DS 2nd sem

1. *Pseudoinverse of an mxn matrix, A* Every matrix $A_{m \times n}$ has a pseudoinverse A^+ or $\text{pinv}(A)$ • If $m = n = \text{rank of } A$, then A is invertible and $A^+ = A^{-1}$ • If rank of $A = n$, (all columns of A are independent), then $A^+ = (A^T A)^{-1} A^T = \text{Left Inverse of } A$, and $A A^+ = I_n$. • If rank of $A = m$, (all rows of A are independent), then $A^+ = A^T (A A^T)^{-1} = \text{Right Inverse of } A$, and $A A^+ = I_m$. • Pseudoinverse A^+ of any matrix A can be obtained in MATLAB using the command ‘ $\text{pinv}(A)$ ’.

a. Generate a 9×9 random integer matrix and verify that $\text{inv}(A) = \text{pinv}(A)$.

```
A=randi([0,9],9,9);
ainv=inv(A);
painv=pinv(A);
if norm(ainv-painv)<1e-10
    disp("Inverse of A is equal to pseudoinverse of A");
else
    disp("Inverse of A is not equal to pseudoinverse of A");
end
```

Inverse of A is equal to pseudoinverse of A

b. Generate a 5×4 random integer matrix and verify that $\text{pinv}(A)$ is same as the left inverse of A .

```
A=randi([0,9],5,4);
apinv=pinv(A);
lainv=inv(A'*A)*A';
if norm(apinv-lainv)<1e-10
    disp("Pseudoinverse of A is equal to left inverse of A");
else
    disp("Pseudoinverse of A is not equal to left inverse of A");
end
```

Pseudoinverse of A is equal to left inverse of A

c. Generate a 3×7 random integer matrix and verify that $\text{pinv}(A)$ is same as the right inverse of A .

```
A=randi([0,9],3,7);
apinv=pinv(A);
arin=A'*inv(A*A');
if norm(apinv-arin)<1e-10
    disp("Pseudonverse of A is equal to Right inverse");
else
    disp("Pseudoinverse of A is not equal to Right inverse");
end
```

Pseudonverse of A is equal to Right inverse

2. Projection of a vector v on a subspace S , which is a column space of matrix A (with all independent columns) is $p = A(ATA)^{-1}ATv$. If some columns in A are dependent (i.e., if $\text{Rank}(A_{m \times n}) < n$), then the projection of a vector v on a subspace S , which is a column space of matrix A is $p = A^*pinv(A)^*v$, where $pinv(A)$ is the pseudo inverse of A .

a. Find the projection of $\begin{pmatrix} -3 & -3 & 8 & 9 \end{pmatrix}$ on the space spanned by $(3 \ 1 \ 0 \ 1), (1 \ 2 \ 1 \ 1), (-1 \ 0 \ 2 \ -1)$.

```
v=[-3;-3;8;9];
A=[3 1 -1;
   1 2 0;
   0 1 2;
   1 1 -1];
if norm(rank(A)-size(A,2))<1e-10
    p=A*inv(A'*A)*A'*v;
    disp(p);
else
    p=A*pinv(A)*v;
    disp(p);
end
```

```
-2.0000
3.0000
4.0000
-0.0000
```

b. Find the projection of $\begin{pmatrix} 2 & 1 & 3 \end{pmatrix}$ on the space spanned by $(1 \ 1 \ 0), (1 \ 2 \ 1)$.

```
u=[2;1;3];
A=[1 1;1 2;0 1];
if norm(rank(A)-size(A,2))
    p=A*inv(A'*A)*A'*u;
    disp(p);
else
    p=A*pinv(A)*u;
    disp(p);
end
```

```
0.6667
2.3333
1.6667
```

c. Find the projection of $\begin{pmatrix} 2 & 1 & 3 \end{pmatrix}$ on the column space of $= (1 \ 1 \ 2 \ 4; 1 \ 2 \ 3 \ 6; 0 \ 1 \ 1 \ 2)$.

```
u=[2;1;3];
A=[1 1 2 4;
   1 2 3 6;
   0 1 1 2];
```

```

if norm(rank(A)-size(A,2))<1e-10
    p=A*inv(A'*A)*A'*u;
    disp(p);
else
    p=A*pinv(A)*u;
    disp(p)
end

```

0.6667
2.3333
1.6667

Consider the matrices given below: A, B, C, D and E

```
A=[1 4 5 6 9;
 3 -2 1 4 -1;
 -1 0 -1 -2 -1;
 2 3 5 7 8];
```

```
B=[3 4;
 1 8];
```

```
C=[0 1 0;
 0 0 1;
 0 4 2];
```

```
D=[1 2 0 1;
 0 1 1 0;
 2 4 0 2];
```

```
E=[0 1 4 1;
 0 0 8 1;
 0 1 4 0;
 1 0 8 0;
 0 1 1 0;
 1 0 1 0];
```

a. which one of the matrices have inverse? Find if it exists.

```

if norm(size(A,1)-size(A,2))<1e-10 && det(A)~=0
    disp("Matrix A has inverse");
else
    disp("Matrix A does not have a inverse");
end

```

Matrix A does not have a inverse

```

if norm(size(B,1)-size(B,2))<1e-6 && det(B)~=0
    disp("Matrix B has inverse");

```

```

else
    disp("Matrix B does not have inverse");
end

```

Matrix B has inverse

```

if norm(size(C,1)-size(C,2))<1e-10 && det(C)~=0
    disp("Matrix C has inverse");
else
    disp("Matrix C does not have inverse");
end

```

Matrix C does not have inverse

```

if norm(size(D,1)-size(D,2))<1e-10 && det(D)~=0
    disp("Matrix D has a inverse");
else
    disp("Matrix D does not have a inverse");
end

```

Matrix D does not have a inverse

```

if norm(size(E,1)-size(E,2))<1e-10 && det(E)~=0
    disp("Matrix E has a inverse");
else
    disp("Matrix e does not have a inverse");
end

```

Matrix e does not have a inverse

3. Least square solution of a linear system, $AX=B$ is:

$\hat{x} = (ATA)^{-1}ATb$, if all the column vectors in A are independent (i.e. if ATA is invertible).

$\hat{x} = \text{pinv}(A)^*b$, if the column vectors in A are not all independent.

- Find the least square solution for the following systems:

a. $x + y = 10; 2x + y = 10; 3x + y = 16; 4x + y = 27; 5x + y = 23$.

```

A=[1 1;
   2 1;
   3 1;
   4 1;
   5 1];
B=[10;10;16;27;23];
if rank(A)==size(A,2)
    x=(A'*A)\(A'*B);
    disp(x);

```

```

else
    x=pinv(A)*B;
    disp(x);
end

```

4.3000
4.3000

b. $2x - 3y + z = 1$; $x + 3y - 4z = -4$; $3x - 2y - z = -1$; $5x - y - 4z = -4$.

```

A=[ 2 -3 1;
    1 3 -4;
    3 -2 -1;
    5 -1 -4];
B=[1;-4;-1;-4];
if rank(A)==size(A,2)
    x=(A'*A)\(A'*B);
    disp(x);
else
    x=pinv(A)*B;
    disp(x);
end

```

-0.3333
-0.3333
0.6667

c. $2x + y = 20$; $2x - 3y = 4$; $3x + y = 28$; $4x + y = 36$;

```

A=[ 2 1;
    2 -3;
    3 1;
    4 1];
B=[ 20;4;28;36];
if rank(A)==size(A,2)
    x=(A'*A)\(A'*B);
    disp(x);
else
    x=pinv(A)*B;
    disp(x);
end

```

8
4

3. Fit a parabola (quadratic function) with $(-2, 0)$, $(-1, 0)$, $(0, 1)$, $(1, 0)$, and $(2, 0)$.

```

x=[ -2 -1 0 1 2];
y=[0 0 1 0 0];
quad=polyfit(x,y,2);

```

```
disp("y= "+quad(1)+"x^2 "+quad(2)+"x "+quad(3));
```

```
y= -0.14286x^2 1.7053e-17x 0.48571
```

4. A middle-aged man was stretched on a rack to lengths $L = 5, 6$, and 7 feet under applied forces of $F = 1, 2$, and 4 tons. Assuming Hooke's law $L = a + bF$, find his normal length a by least squares.

```
F=[1;2;4];
L=[5;6;7];
A=[ones(size(F)) F];
x=(A'*A)\(A'*L);
a=x(1);
b=x(2);
disp("Normal length a = "+a);
```

```
Normal length a = 4.5
```

```
disp("Proportionality constant b = "+b);
```

```
Proportionality constant b = 0.64286
```

5. Find the best straight-line t (least squares) to the measurements: $b = 4$ at $t = -2$, $b = 3$ at $t = -1$, $b = 1$ at $t = 0$ and $b = 0$ at $t = 2$. Then find the projection of $b = (4; 3; 1; 0)$ onto the column space of $A = [1 \ -2; 1 \ -1; 1 \ 0; 1 \ 2]$

```
A=[1 -2; 1 -1; 1 0; 1 2];
t=[-2;-1;0;2];
b=[4;3;1;0];
A=[ones(size(t)) t];
x=(A'*A)\(A'*b);
a=x(1);
beta=x(2);
disp("Best-fit line: b=a+beta*t");
```

```
Best-fit line: b=a+beta*t
```

```
disp("a = "+a+" and "+ "beta = "+beta);
```

```
a = 1.7429 and beta = -1.0286
```

```
bproj=A*x;
disp("projection of b onto col(A):"); disp(bproj);
```

```
projection of b onto col(A):
3.8000
2.7714
1.7429
-0.3143
```

6. Fit a best straight line passing through $(-3, 4), (-2, 2), (-1, 0), (0, 0), (1, -2), (2, -2)$ and $(3, -3)$.

```
x=[-3;-2;-1;0;1;2;3];
y=[4;2;0;0;-2;-2;-3];
```

```

A=[ones(size(x)) x];
p=(A'*A)\(A'*y);
a=p(1);
b=p(2);
disp("Best-fit straight line: y=a+b*x"); disp("a = "+a+" and "+" b = "+b);

```

Best-fit straight line: $y=a+b*x$
 $a = -0.14286$ and $b = -1.1071$

7. Consider the following data:

a. Find the equation of a regression line for the following data using excel.

```

[B,text]=xlsread('Excel\excelsheet_1.xlsx');
x=B(:,1);
y=B(:,2);
n=length(x);
ATA=[sum(x.^2),sum(x);sum(x),n]

```

ATA = 2×2
 $\begin{matrix} 111150 & 650 \\ 650 & 27 \end{matrix}$

```
ATb=[sum(x.*y);sum(y)]
```

ATb = 2×1
 $\begin{matrix} 10^5 \\ 5.3044 \\ 0.0310 \end{matrix}$

```
m_and_c = inv(ATA)*ATb
```

m_and_c = 2×1
 $\begin{matrix} 4.7729 \\ -0.1026 \end{matrix}$

b. Enter the data in an excel sheet, and then find the regression line using MATLAB. Also plot the regression line and the data points in the same figure.

- Refer to the class notes for this.

```

clf;
[B,text]=xlsread('Excel\excelsheet_1.xlsx');
x=B(:,1);
y=B(:,2);
n=length(x);
A=[x,ones(n,1)]

```

A = 27×2
 $\begin{matrix} 0 & 1 \\ 1 & 1 \\ 2 & 1 \\ 3 & 1 \end{matrix}$

```
4      1
5      1
6      1
7      1
8      1
9      1
10     1
11     1
12     1
13     1
14     1
:
:
```

```
ATA=[sum(x.^2),sum(x);sum(x),n]
```

```
ATA = 2×2
111150      650
650         27
```

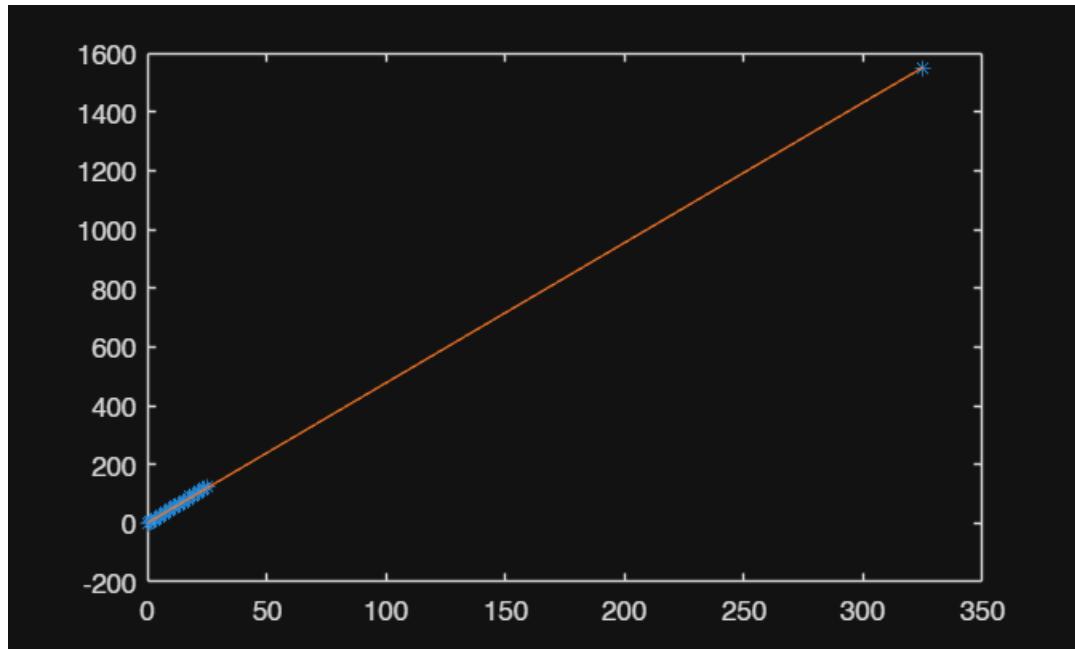
```
ATb=[sum(x.*y);sum(y)]
```

```
ATb = 2×1
105 ×
5.3044
0.0310
```

```
m_and_c = inv(ATA)*ATb
```

```
m_and_c = 2×1
4.7729
-0.1026
```

```
y_projected=A*inv(ATA)*ATb;
plot(x,y, '*')
hold on
plot(x,y_projected)
```



8. a. Generate a data for regression with a fixed $m=9$, $c=5$ for $x = -25, -24, -23, \dots, 24, 25$ and introducing a noise with standard deviation 3.

```
clf;
m=9;
c=5;
x=-25:0.1:25

x = 1x501
-25.0000  -24.9000  -24.8000  -24.7000  -24.6000  -24.5000  -24.4000  -24.3000  ...

n=length(x)

n =
501

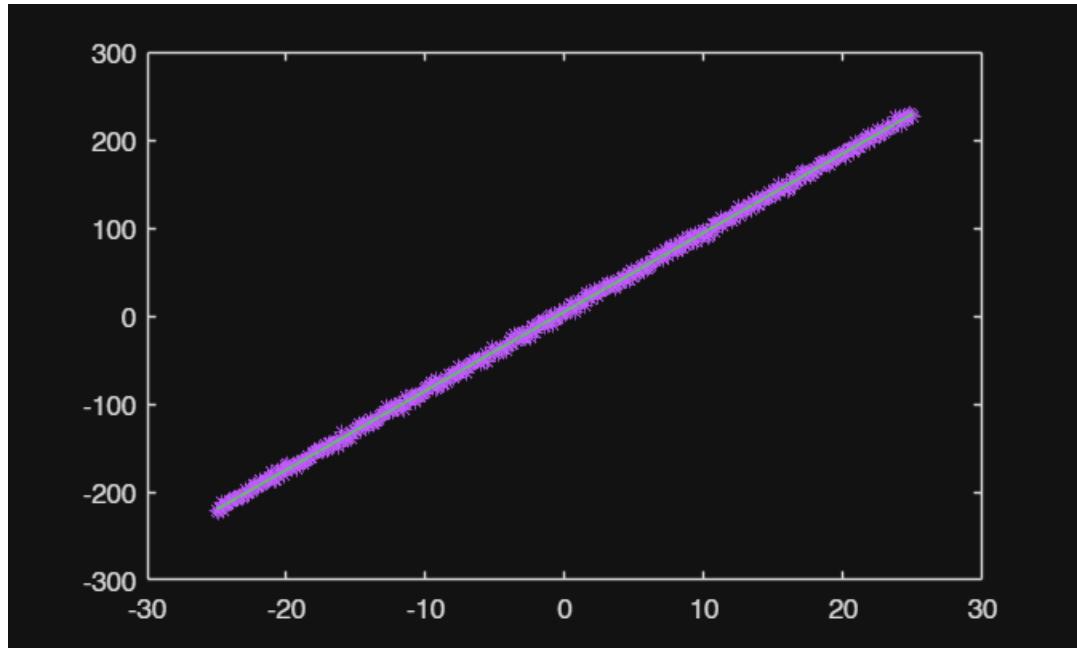
y=m*x+c;
std=3;
noise=std*randn(1,n)

noise = 1x501
-0.1394  -2.9003  -1.4137  5.2057  -2.3326  -5.0514  0.5311  -0.3734  ...

ynoise=y+noise;
```

b. Using the data generated above, re-estimate the values of m and c . Also find the regression line and plot it in MATLAB.

```
plot(x,ynoise,'*')
hold on
A=[x' ones(n,1)];
ynoise=ynoise';
m_and_c=pinv(A)*ynoise;
y_projected=A*pinv(A)*ynoise;
plot(x,y_projected);
```



m_and_c

```
m_and_c = 2x1  
8.9903  
5.0157
```